Instruction-tuning Aligns LLMs to the Human Brain





Khai Loong Aw, Syrielle Montariol*, Badr AlKhamissi*, Martin Schrimpf⁺, Antoine Bosselut⁺

*Equal contribution, *Equal supervision / senior authors

Preliminaries

Language stimuli

Brain alignment:
Evaluate similarity
of LLM internal
representations to
human brain activity

"Beekeeping encourages the conservation of local habitats. It is in every beekeeper's ..."
 "If you were to journey to the North of England, you would come to a valley that ..."
 "Harry had never believed he would meet a boy he hated more than Dudley, but ..."

T5

T5 XXL

Flan-T5

T5

T5

Flan-T5

Flan-T5

Flan-T5

Flan-T5 Small representations

Human

fMRI activity

LLaMA

Vicuna

Vicuna

Language model

1. Train linear regression $f(\bullet\bullet\bullet)\approx$ 2. Test on held-out data

Instruction-Tuned

Language Models

Instruction:

Write a paragraph about the given topic. **Input:**

The importance of using renewable energy.

Instruction-tuned Language Model

Output:

The use of renewable energy is growing rapidly in relevance and importance..

1 Pretrained Language Models

Input:

The use of renewable energy is growing

Language Model

Output: rapidly in relevance and importance as the world looks towards ...

> Model trained to continue sequences

Results

lan-Alpaca

LLaMA

Flan-Alpaca

Flan-Alpaca Large **LLaMA**

Vicuna

Flan-Alpaca

■ Brain alignment ▲ LM properties

> Model fine-tuned to provide responses to queries

ment correlates

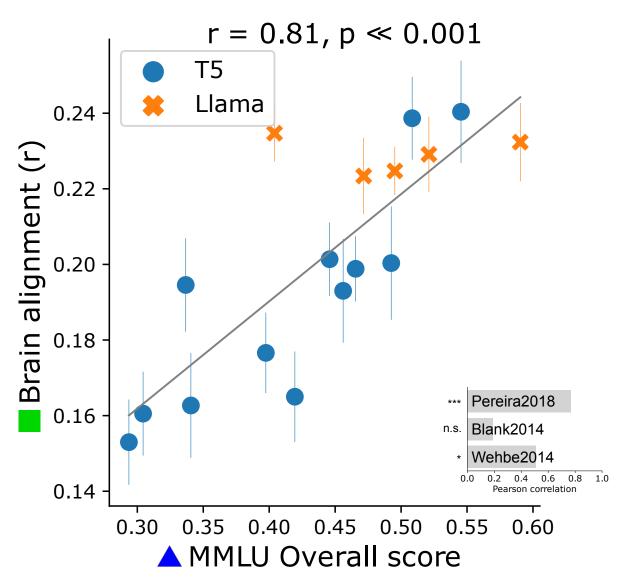
Instruction tuning improves model

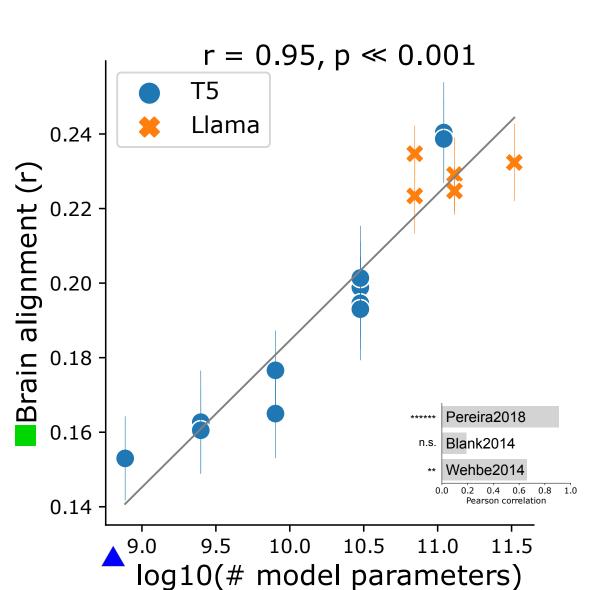
Model Size

brain alignment by 6.2% (avg.)

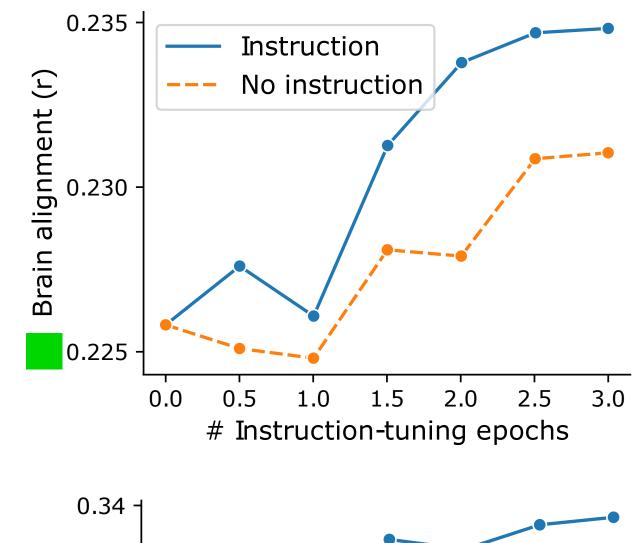
Improvements are due to both training data and process of instruction-tuning

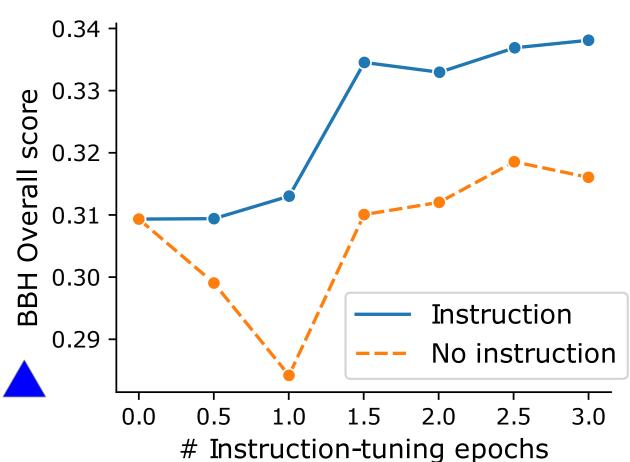
Brain alignment correlates with MMLU & Model Size





Average Brain alignment (Pearson corr.) T5 0.24 Llama 0.22 uction-tuned LM 0.20 -0.18 -0.16 Instr 0.14 average improvement: 6.2% 0.12 0.10 0.12 0.14 0.16 0.18 0.20 0.22 0.24 Vanilla LM





Correlation between brain alignment and performance **MUCH** higher on **world knowledge** benchmarks

Task category	$ \begin{array}{c} \textbf{Brain Alignment} \\ \textbf{Correlation} \ (r) \end{array} $	$\begin{array}{c} \textbf{Corrected} \\ p\textbf{-value} \end{array}$		${f Average} \ (\uparrow) \ {f Performance}$
MMLU – Overall Score	0.809	0.000329	57	0.36
BBH – Overall score	0.384	0.177	23	0.28
BBH – Algorithmic reasoning	0.194	0.558	8	0.22
BBH – Language understanding	0.163	0.585	3	0.43
BBH – World knowledge	$\boldsymbol{0.679}$	0.005	5	0.36
BBH – Multilingual reasoning	-0.035	0.895	1	0.19
BBH - Others	0.478	0.083	6	0.27

